



## Recognition of people and animals in camera trap images

Michiel Stock  
Twitter:  
@michielstock

## Citizen science vs privacy

Camera trap  
images

Image processing

## Convolutional neural network

## Conclusions

# Automated recognition of people and identification of animal species in camera trap images

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and Bernard De Baets

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Ghent University

September 2018



# Problem statement

Recognition of  
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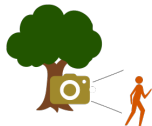
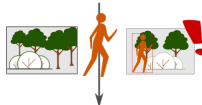


Image classification



Citizen science

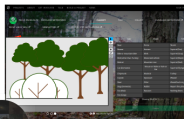


Image management



Agouti



Open data publication



zenodo



# Camera trap images

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- Camera trap survey
  - ▶ INBO and UHasselt
  - ▶ Hoge Kempen National Park





# Camera trap images

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  - ▶ INBO and UHasselt
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- Images
  - ▶ Motion detection
  - ▶ Sequences
  - ▶ Annotations







# Image labels

Recognition of  
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Vernacular name	Scientific name	
Ass	<i>Equus asinus</i>	8
Beech Marten	<i>Martes foina</i>	17
Carriion Crow	<i>Corvus corone</i>	3
Common Pheasant	<i>Phasianus colchicus</i>	1
Domestic Cat	<i>Felis catus</i>	14
Domestic Dog	<i>Canis familiaris</i>	4
Eurasian Blackbird	<i>Turdus merula</i>	24
Eurasian Jay	<i>Garrulus glandarius</i>	1
Eurasian Red Squirrel	<i>Sciurus vulgaris</i>	6
European Hare	<i>Lepus europaeus</i>	10
Great Spotted Woodpecker	<i>Dendrocopos major</i>	1
Great Tit	<i>Parus major</i>	9
Greylag Goose	<i>Anser anser</i>	15
Horse	<i>Equus caballus</i>	30
House Sparrow	<i>Passer domesticus</i>	10
Long-tailed Field Mouse	<i>Apodemus sylvaticus</i>	8
Red Fox	<i>Vulpes vulpes</i>	236
Sheep	<i>Ovis aries</i>	9
Short-toed Treecreeper	<i>Certhia brachydactyla</i>	1
Song Thrush	<i>Turdus philomelos</i>	1
Western European Hedgehog	<i>Erinaceus europaeus</i>	2
Western Roe Deer	<i>Capreolus capreolus</i>	1282
Wild Boar	<i>Sus scrofa</i>	190
Human		27
Blank		2092
PickupSetup		308
<b>Total</b>		<b>4309</b>



# Environmental conditions

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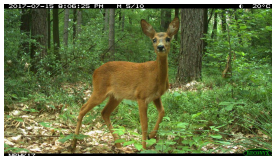
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ideal



fog



raindrops



poor illumination



# Animal positioning

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context occlusion



auto-occlusion



part of the animal



very close



far away



different animals



# Hardware limitations

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overexposed



blurred



## Conclusions



background





# Convolutional neural network

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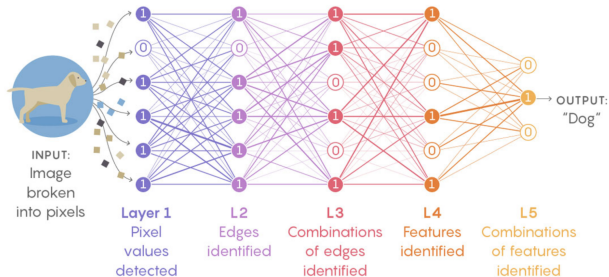
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Lucy Reading-Ikkanda/Quanta Magazine



# Hierarchical classification

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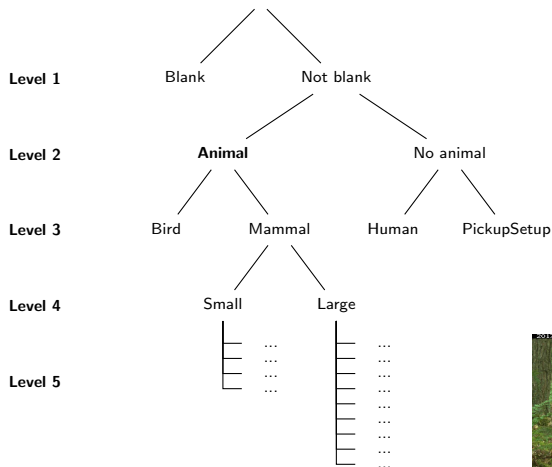
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# Neural network performance

Recognition of  
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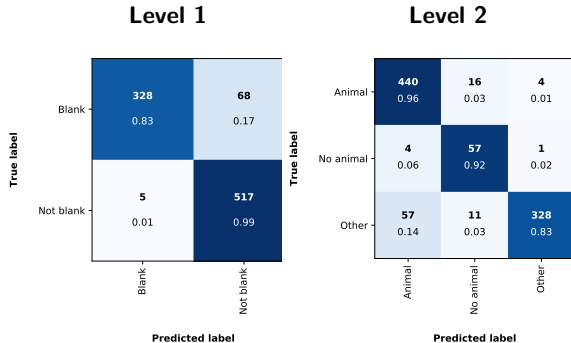
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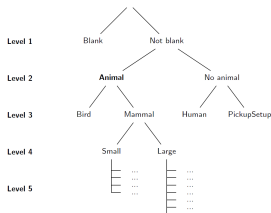
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Predicted label

Predicted label







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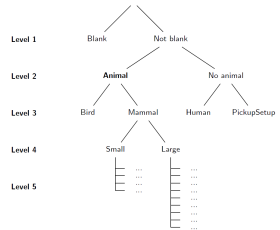
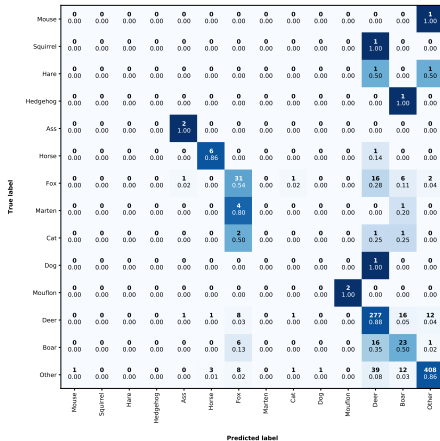
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## Level 5





# Class activation mapping

Recognition of  
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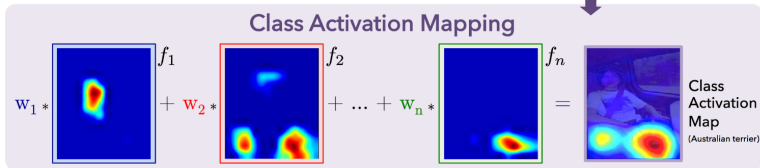
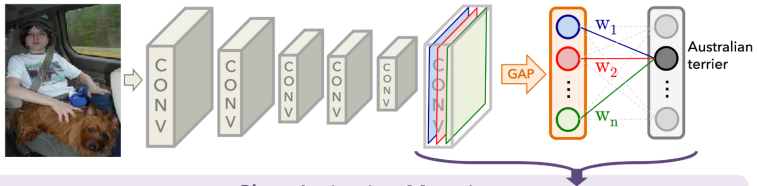
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Zhou et al. (2016)



# Class activation mapping

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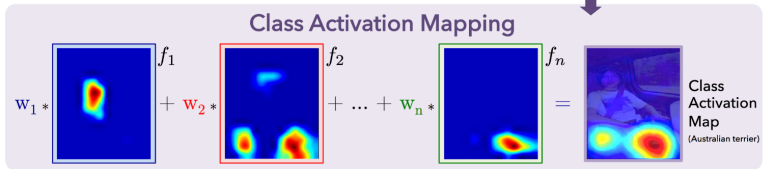
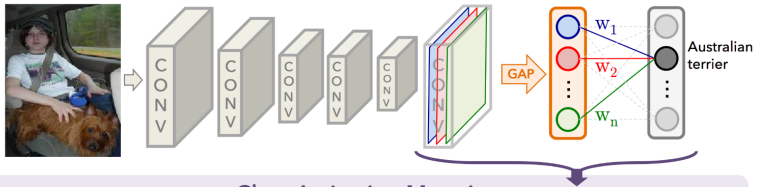
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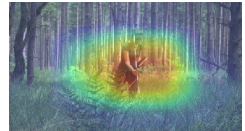
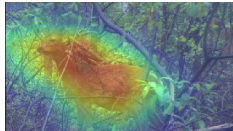
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# Conclusions and future perspectives

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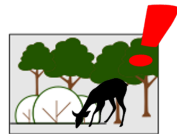
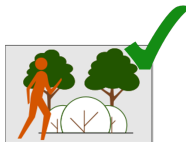
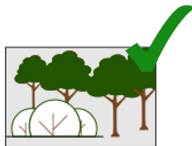
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Conclusions



- ▶ **More data**
- ▶ Extensive training
- ▶ Sequence classification
- ▶ Multiple species



# Acknowledgments

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Conclusions

## People involved:

- KERMIT: Laura Hoebeke, Michiel Stock & Bernard De Baets
- INBO: Stijn Van Hoey & Jim Casaer

